#### Complexity of Subregular Stringsets

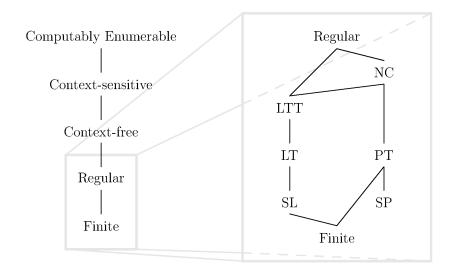
#### Jeffrey Heinz



March 2, 2021

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# COMPUTATIONAL COMPLEXITY



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# My own interests in subregular complexity...

- ... began with these observations:
  - 1 Many phonotactic patterns are regular.
  - 2 Many regular patterns are *not* possible phonotactic patterns.

So  $\it which$  regular languages constitute possible phonotactic patterns?

#### Along the way I learned:

- 1 There is a rich field of study in computer science on *subregular* complexity.
- 2 There is a rich field of study in computer science on *machine learning* of regular languages and transductions.
- 3 There are many applications in linguistics, artificial intelligence, robotic planning and control, model checking,

. . .

# MEASURING COMPLEXITY

One idea is that a regular language  $L_1$  is more complex than  $L_2$  if

- 1 The smallest DFA recognizing  $L_1$  is larger than the smallest DFA recognizing  $L_2$ .
- 2 The smallest regular expression recognizing  $L_1$  is larger than the smallest regular expression recognizing  $L_2$ .

In contrast to these *intensional* measures

1 The subregular classes we study today will provide complexity measures *independent* of the size of such representations.

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## Intuitions?

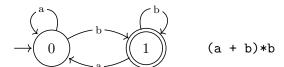
Consider the four sets of strings below. Any intutions about which set of strings is more or less complex than any others?

- Strings must end with b.
- Strings have odd many bs.
- Strings have at least one b.
- Strings have exactly one b.

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# COMPARING "FINAL-B" WITH "ODD-B"

Strings must end with b.



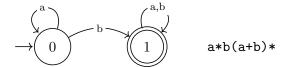
Strings have odd many bs.



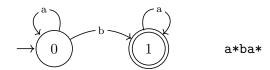
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# COMPARING "AT LEAST ONE B" WITH "EXACTLY ONE B"

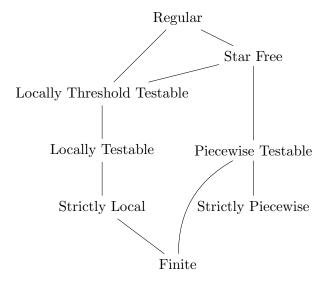
Strings have at least one b.



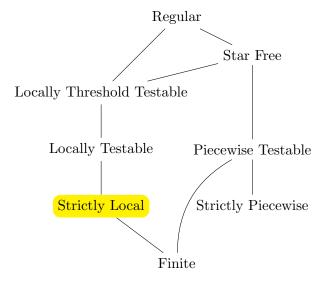
Strings have exactly one b.



#### Subregular Complexity



#### Subregular Complexity



## FACTORS

The notion of *substring*, also called *factor*, is key to understanding the "local" subregular classes.

#### k-Factors

- A string u is a k-factor (substring of length k) of a string v if there exist strings x, y such that v = xuy and |u| = k. We write  $u \sqsubseteq_k v$ .
- $factor_k(w)$  equals the set  $\{u \mid u \sqsubseteq_k w\}$  if |w| > k and equals  $\{w\}$  if  $|w| \le k$ .
- factor<sub>k</sub>(S) equals the set  $\bigcup_{w \in S}$  factor<sub>k</sub>(w).

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#### EXERCISE

Identify the following sets.

- 1  $factor_2(abcd)$
- 2 factor<sub>3</sub>(abcd)
- $3 \text{ factor}_6(abcd)$
- 4 factor<sub>2</sub>(aaaa)
- 5  $factor_2(aaaa, bbbb, caabc)$

# STRICTLY LOCAL LANGUAGES

Let  $\bowtie$  and  $\bowtie$  denote left and right word boundaries. A language L is Strictly k-Local if there is a finite set of strings  $S \subseteq \mathtt{factor}_k(\{\bowtie\} \cdot \Sigma^* \cdot \{\bowtie\})$  such that

$$L = \{ w \in \Sigma^* \mid \mathtt{factor}_k(\rtimes w \ltimes) \subseteq S \}$$

A language L is Strictly Local if there is some k for which it is Strictly k-Local. We sometimes write [S] to denote the extension of S.

## STRICTLY LOCAL LANGUAGES

#### Notes

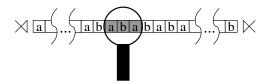
- $\bullet$  Elements in S are called **permissible factors**.
- Elements in  $factor_k(\{\times\} \cdot \Sigma^* \cdot \{\ltimes\})$  not in S are called forbidden factors.

#### Exercises

- 1 Let  $S = \{ \rtimes a, ab, ba, a \ltimes \}$ . What is [S]?
- 2 For what k is [S] Strictly k-Local?
- 3 Which factors are forbidden?

## STRICTLY LOCAL LANGUAGES: SCANNERS

Intuitively, if L is Strictly k-Local, then deciding whether a string w belongs to L simply requires scanning w for forbidden substrings. If any is found w is rejected. If every substring in w is permissible then w is accepted.



(McNaughton and Papert 1971, Rogers and Pullum 2011)

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(McNaughton and Papert 1971, Rogers and Pullum 2011)

#### More exercises

Consider the languages below.

- (1) Strings end with a b.
- (2) The second to last symbol in all strings is b.
- (3) The third to last symbol in all strings is b.

For each, one explain why it is Strictly Local. Assume  $\Sigma = \{a,b\}.$ 

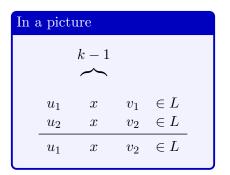
## THEOREMS

- 2 FIN  $\subseteq$  SL
- 3 For each k, FIN  $\not\subseteq \operatorname{SL}_k$
- 4 For each k,  $SL_k$  is closed under intersection, but neither complement nor union.

# Grammar-independent Characterization of SL

#### **Suffix Substitution Closure**

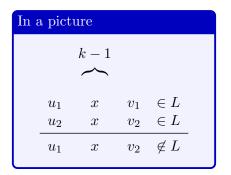
A language L is Strictly Local iff there is a k such that for all strings  $u_1, v_1, u_2, v_2 \in \Sigma^*$  and for all strings x of length k-1 whenever  $u_1xv_1, u_2xv_2 \in L$  then  $u_1xv_2 \in L$ .



## Proving some languages are not SL

The SSC helps us prove languages are not Strictly k-Local and even not Strictly Local for any k.

• To show L is not  $SL_k$ , find  $u_1, v_1, u_2, v_2$  and x of length k-1 such that



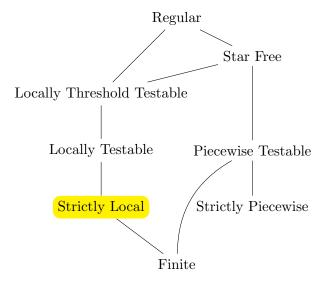
• To show L is not SL, find  $u_1, v_1, u_2, v_2$  and x for each k!

## EXERCISES

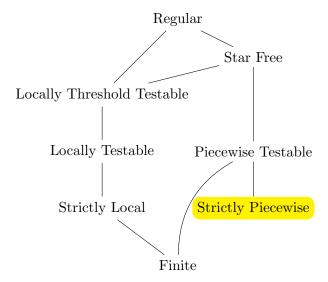
Prove the following languages are not SL for any k.

- (4) Strings contain at least one b.
- (5) Strings contain at most one b.
- (10) Strings contain an a between every pair of bs.

#### Subregular Complexity



#### Subregular Complexity



# Subsequences

The notion of *subsequence* is key to understanding the "piecewise" subregular classes.

#### k-Subsequences

• A string u is a subsequence of a string  $v = \sigma_1 \sigma_2 \dots \sigma_n$  if

$$v \in \Sigma^* \sigma_1 \Sigma^* \sigma_2 \Sigma^* \dots \Sigma^* \sigma_n \Sigma^*$$
.

We write  $u \prec v$ .

- $subseq_k(w)$  equals the set  $\{u \mid u \leq_k w, |u| \leq k\}$ .
- subseq<sub>k</sub>(S) equals the set  $\bigcup_{w \in S} \leq_k (w)$ .

# EXERCISE

Identify the following sets.

- 1  $subseq_2(abcd)$
- $\mathbf{2} \ \mathtt{subseq}_3(abcd)$
- $3 \text{ subseq}_2(aaaa,bbbb,caabc)$

## STRICTLY PIECEWISE LANGUAGES

A language L is Strictly k-Piecewise if there is a finite set of strings  $S \subseteq \mathtt{subseq}_k(\Sigma^*)$  such that

$$L = \{w \in \Sigma^* \mid \mathtt{subseq}_k(w) \subseteq S\}$$

A language L is Strictly Piecewise if there is some k for which it is Strictly k-Piecewise. We use [S] to denote the extension of S.

#### STRICTLY PIECEWISE LANGUAGES

#### Notes

- $\bullet$  Elements in S are called **permissible subsequences**.
- Elements in  $\operatorname{subseq}_k(\Sigma^*)$  not in S are called forbidden subsequences.

#### Exercises

- 1 Let  $S = \{\varepsilon, a, b, ab, ba\}$ . What is [S]?
- 2 For what k is [S] Strictly k-Piecewise?
- 3 Which subsequences are forbidden?

#### More exercises

- 1 Recall this language mentioned earlier.
  - (5) Strings contain at most one b.

Explain why it is Strictly 2-Piecewise. Assume  $\Sigma = \{a, b\}$ .

2 Recall Samala.

possible Samala words	impossible Samala words
∫tojonowonowa∫	stojonowonowa∫
stojonowonowas	∫tojonowonowas
pi <mark>s</mark> tonoskiwat	pisotono∫ikiwat
sanisotonoskiwas	∫anipisotono∫ikiwas

Assuming  $\Sigma = \{s, S, t, o\}$ , what are the forbidden subsequences?

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## STRICTLY PIECEWISE LANGUAGES

Intuitively, if L is Strictly k-Piecewise, then deciding whether a string w belongs to L simply requires checking its k-subsequences for forbidden ones. If any is found w is rejected. If every subsequence in w is permissible then w is accepted.

(Rogers et al. 2010)

# Infinite Hierarchy of SP classes

#### Theorems

- $\mathbb{P} \operatorname{SP}_1 \subseteq \operatorname{SP}_2 \dots \operatorname{SP}_k \subseteq \operatorname{SP}_{k+1} \dots \subseteq \operatorname{SP}_k$
- 2 FIN ⊈ SP
- 3 For each k,  $SP_k$  is closed under intersection, but neither complement nor union.

(Rogers et al. 2010)

# CHARACTERIZING STRICTLY PIECEWISE LANGUAGES

#### Subsequence Closure

A language L is Strictly Piecewise iff whenever  $w \in L$  every subsequence of w also belongs to L.

Subsequence Closure helps us prove languages are not Strictly Piecewise.

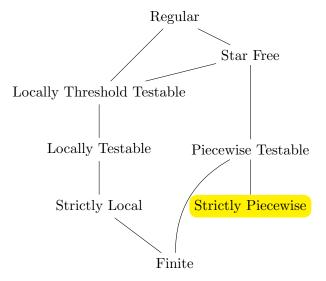
(Rogers et al. 2010)

## EXERCISES

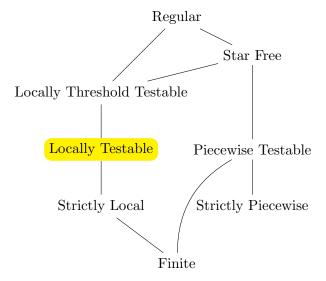
Prove the following languages are not SP.

- 1 Strings do not contain the substring bb.
- 2 Strings contain an odd number of bs.

#### Subregular Complexity



#### Subregular Complexity



#### LOCALLY TESTABLE LANGUAGES

A language L is Locally k-Testable if it is a Boolean combination of finitely many Strictly k-Local languages.

#### Boolean operators

- intersection  $(L_1 \cap L_2)$
- union  $(L_1 \cup L_2)$
- complement  $(\Sigma^* L)$

A language is Locally Testable if it is Locally k-Testable for some k.

# LOCALLY TESTABLE LANGUAGES

A language L is Locally k-Testable if and only if there is a set S of sets of k-factors such that

$$L = \{ w \mid \mathtt{factor}_k(\rtimes w \ltimes) \in S \}$$

Note: It follows a locally 2-testable language can include aaba and exclude aa but a strictly 2-local language cannot.

# Grammar-independent characterization of Locally Testable Languages

### Locally Testability

A language L is Locally Testable iff there exists k such that for all  $u,v\in\Sigma^*$ , if u and v have the same k-factors then  $u,v\in L$  or  $u,v\not\in L$ .

(McNaughton and Papert 1971, Rogers and Pullum 2011)

#### EXERCISE

Using Locally Testability, prove the language below is not LT.

- 1 Strings contain exactly one b.
- 2 Strings can contain the subsequence s $\int$  but not  $\int$ s.

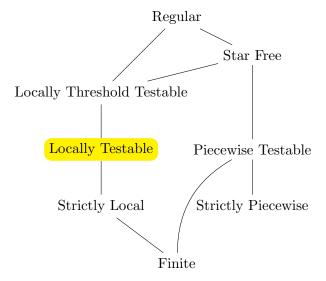
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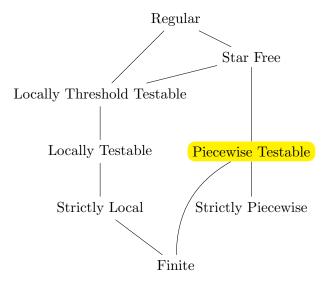
#### THEOREMS

- 1 LT<sub>1</sub>  $\subseteq$  LT<sub>2</sub>...LT<sub>k</sub>  $\subseteq$  LT<sub>k+1</sub>...  $\subseteq$  LT.
- 2 For each k,  $SL_k \subseteq LT_k$ .
- 3 LT and SP are incomparable.
- 4 Closing LT under concatenation yields the Star-Free languages.

(McNaughton and Papert 1971, Rogers and Pullum 2011)

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#### PIECEWISE TESTABLE LANGUAGES

A language L is Piecewise k-Testable if it a Boolean combination of finitely many Strictly k-Piecewise languages.

## Boolean operations (and regular expression equivalents)

- intersection  $(L_1 \& L_2)$
- union  $(L_1 + L_2)$
- complement  $(\overline{L})$

A language is Piecewise Testable if it is Piecewise k-Testable for some k.

### PIECEWISE TESTABLE LANGUAGES

A language L is Piecewise k-Testable if and only if there is a set S of sets of k-subsequences such that

$$L = \{w \mid \mathtt{subseq}_k(w) \in S\}$$

Note: It follows a piecewise 2-testable language can include aaba and exclude aa but a strictly 2-piecewise language cannot.

# Grammar-independent characterization of Piecewise Testable Languages

#### Piecewise Testability

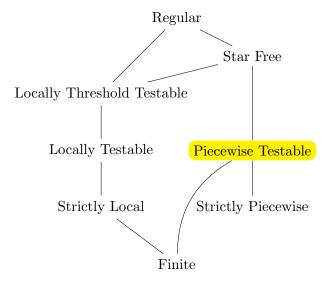
A language L is Piecewise Testable iff there exists k such that for all  $u, v \in \Sigma^*$ , if u and v have the same k-long subsequences then either  $u, v \in L$  or  $u, v \notin L$ .

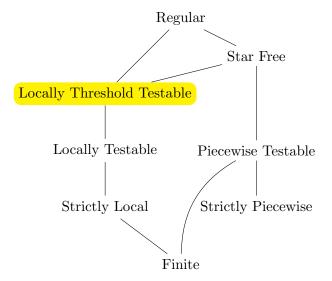
(Simon 1975)

#### THEOREMS

- 2 For each k,  $SP_k \subseteq PT_k$ .
- 3 PT and LT are incomparable.

(Rogers et al. 2010, 2013)





### LOCALLY THRESHOLD TESTABLE LANGUAGES

Intuitively, membership in an  $LT_{t,k}$  language depends only on the factors of length substrings of length k counting their occurrences up to some threshold t. So this information needs to be identified and stored in memory to decide membership.

Whereas LT attended to sets of factors, LTT attends to multisets of factors counting up to t.

# Grammar-independent characterization of Locally Threshold Testable Languages

## Locally Theshold Testability

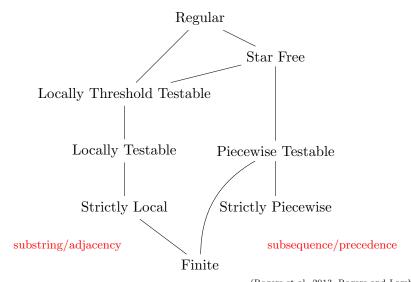
A language L is Locally Testable iff there exists k such that for all  $u, v \in \Sigma^*$ , if u and v have the same k-factors and the same number of occurrences of the same k-factors, counting up to some threshold t, then either  $u, v \in L$  or  $u, v \notin L$ .

(Thomas 1982, Rogers and Pullum 2011)

#### EXERCISES

- Explain why (1) is LTT. What are the t and k values? (1) Strings contain two bb substrings.
- Explain why (2) below is not LTT for any t, k.
  - (2) Strings do not contain ab as a subsequence. Assume  $\Sigma = \{a,b,c\}$ .

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(Rogers et al. 2013, Rogers and Lambert 2019)

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